

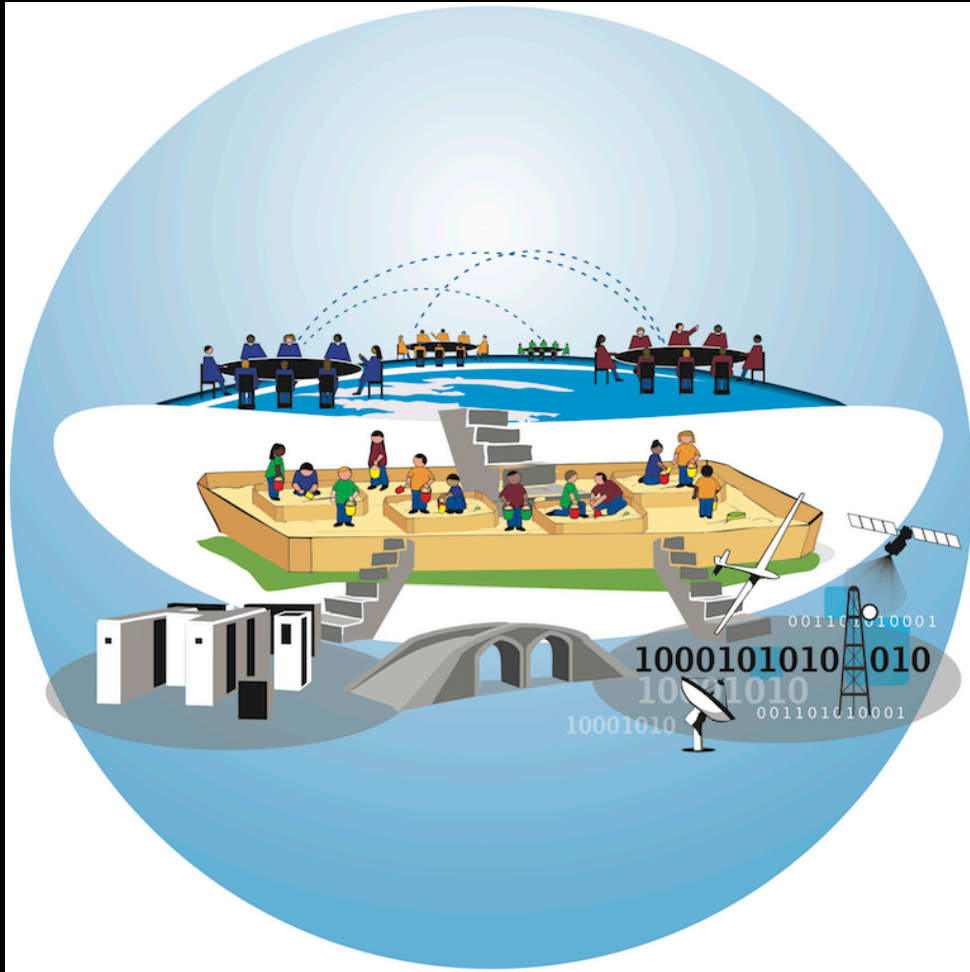
# **NASA EARTH EXCHANGE IN SUPPORT OF THE NATIONAL CLIMATE ASSESSMENT**

**NASA Advanced Supercomputing/Earth Science Division  
NASA Ames Research Center  
Moffett Field, CA**

**Rama Nemani, [rama.nemani@nasa.gov](mailto:rama.nemani@nasa.gov)  
Weile Wang, [weile.wang@gmail.com](mailto:weile.wang@gmail.com)**

**November 20, 2012**

# NASA EARTH EXCHANGE



NEX is a virtual collaborative that brings scientists together in a knowledge-based social network and provides the necessary tools, computing power, and data to accelerate research and innovation.



## Pleiades

NASA's fastest supercomputer



**COLLABORATION**

(over 340 members)

**COMPUTING**

(9PB, 180,000 cores)



**Centralized  
Data Repository**  
(over 400 TB of data)

# NCA@NEX Objectives

- **Develop high resolution climate projections data.**

Empower the community for creating a high resolution downscaled climate projections data set useful for climate impact assessments.

- **Develop climate change indicators and monitoring:**

Analysis of long-term satellite data for the U.S. to quantify spatial and temporal patterns in indicators of terrestrial ecosystem condition.

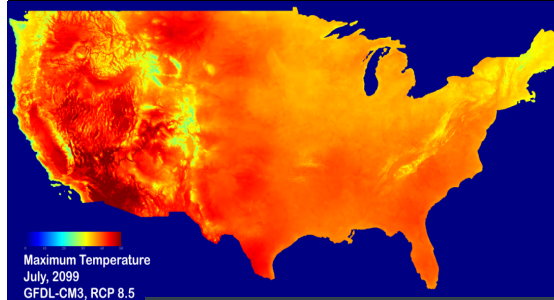
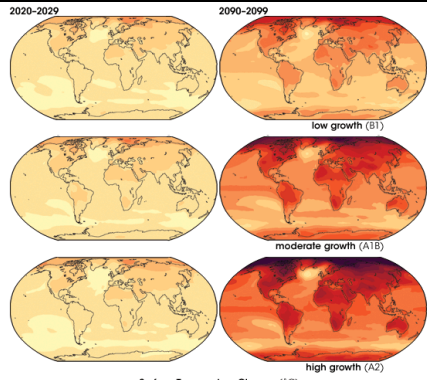
- **Facilitate climate impacts modeling:**

Facilitate ensemble modeling experiments to quantify changes in biogeochemical cycling in response to changes in climate as well as land use.

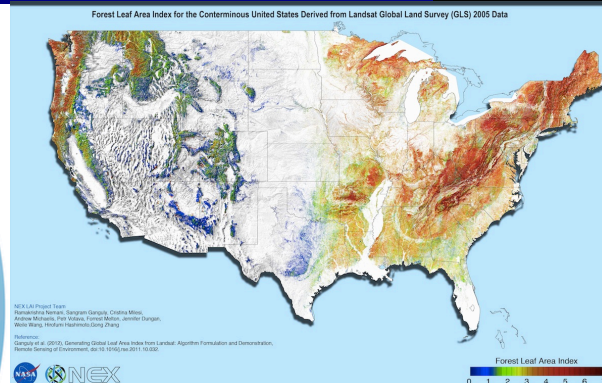
# NEX Enabling the National Climate Assessment

Promoting consistency, repeatability, and transparency in global change science

Climate modeling

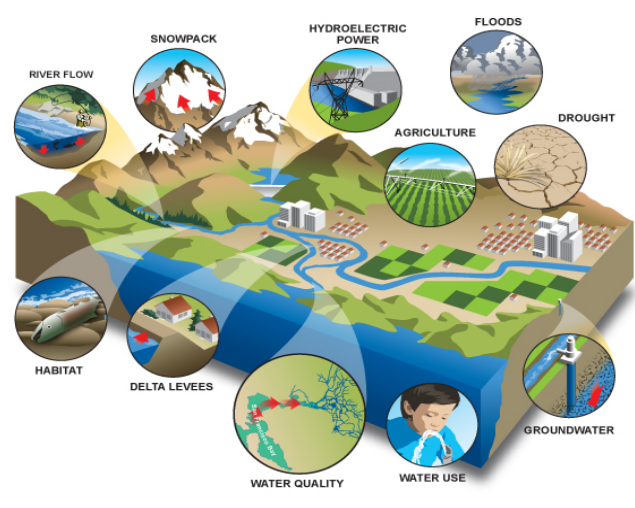
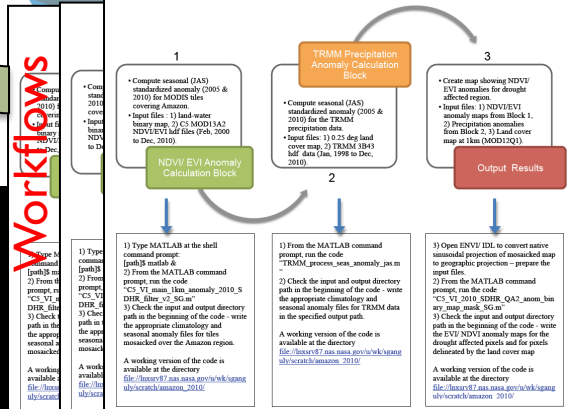


Downscaling



Long-term Satellite  
data analysis

Every 4 years

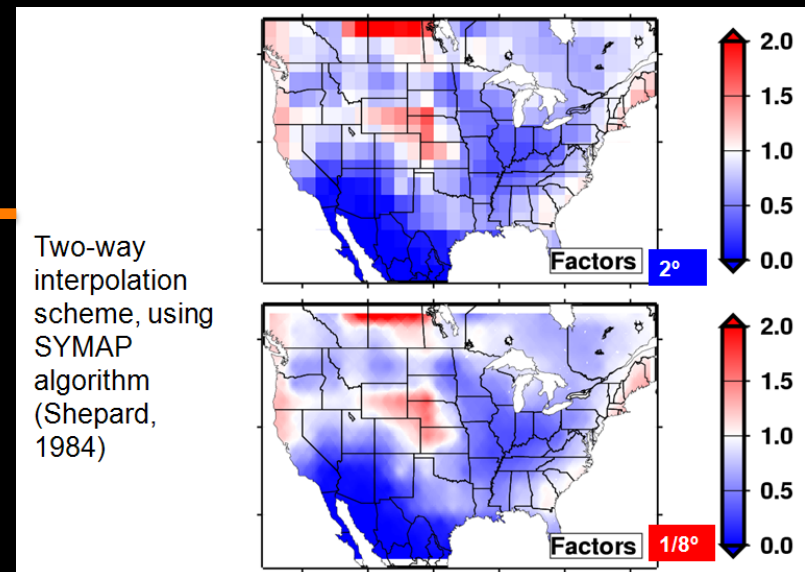
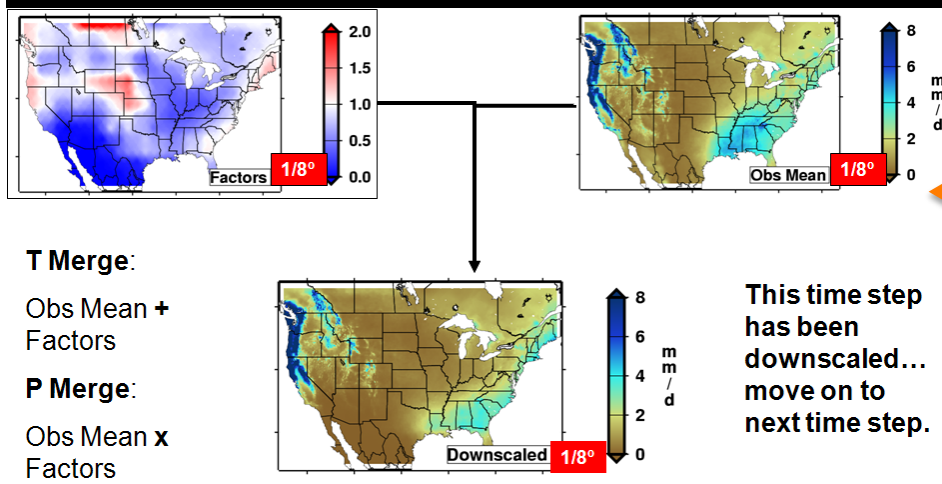
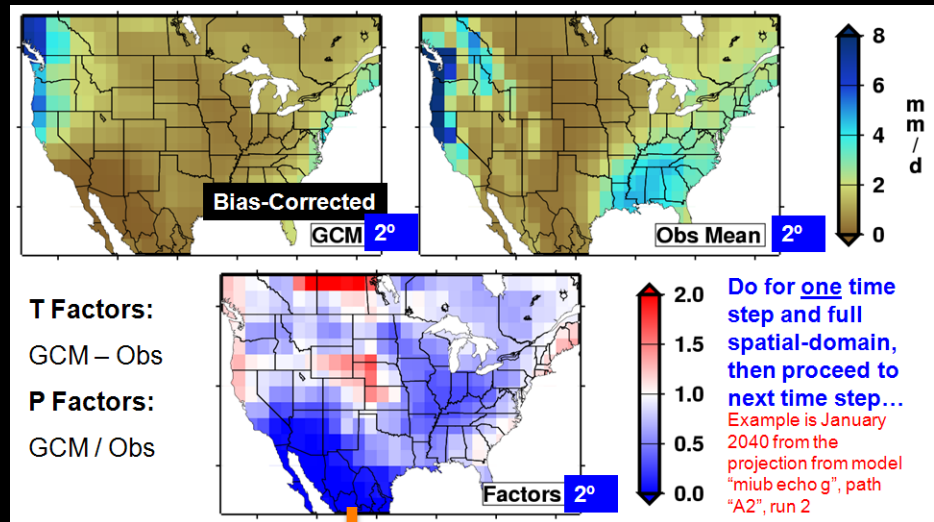
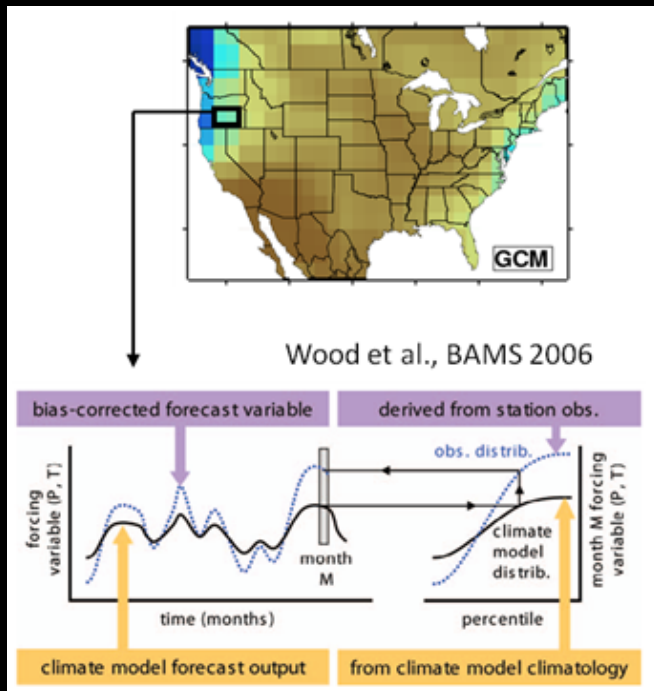


Modeling impacts

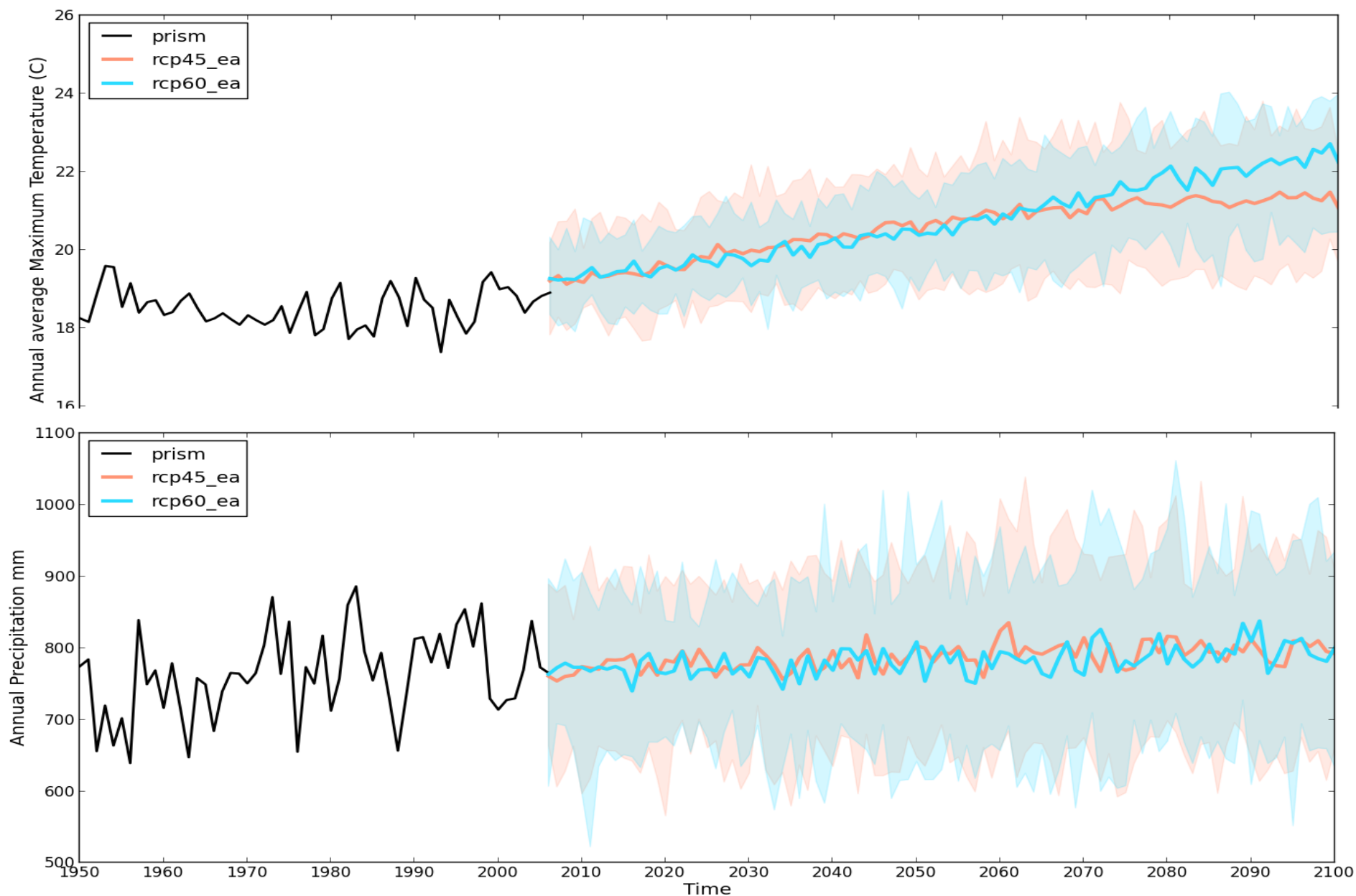


# Activity 1: Creating high resolution (downscaled) climate projections

## Bias-Correction Spatial Downscaling



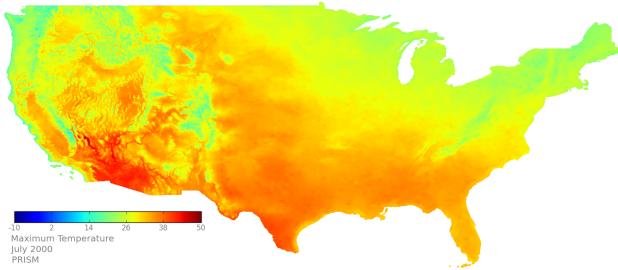
Not necessarily NASA's strength, but highly desired by the community



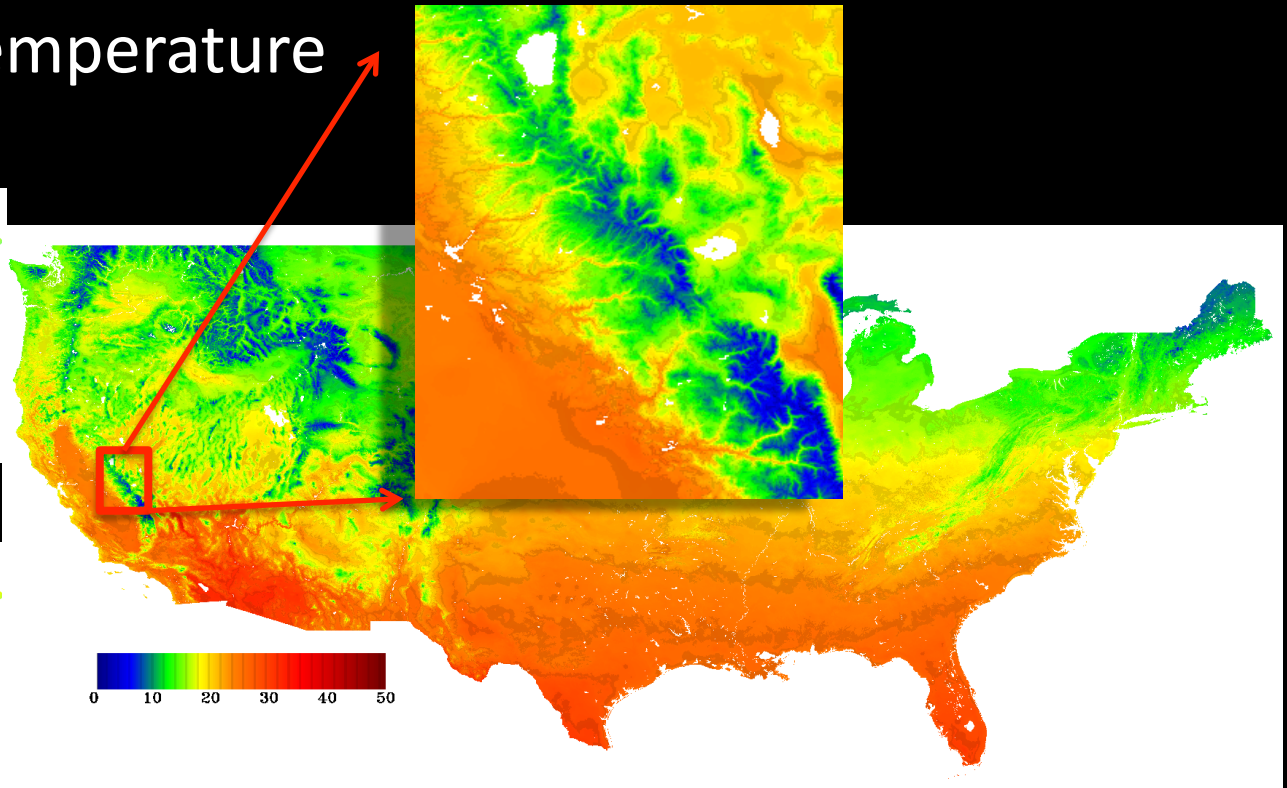
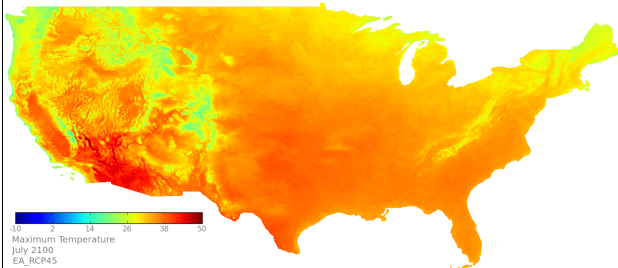
Ensemble mean and spread of the downscaled CMIP5 climate variables for conterminous US: (Top) annual maximum temperature; (Bottom) annual total precipitation

# July Max Temperature

2000



2100



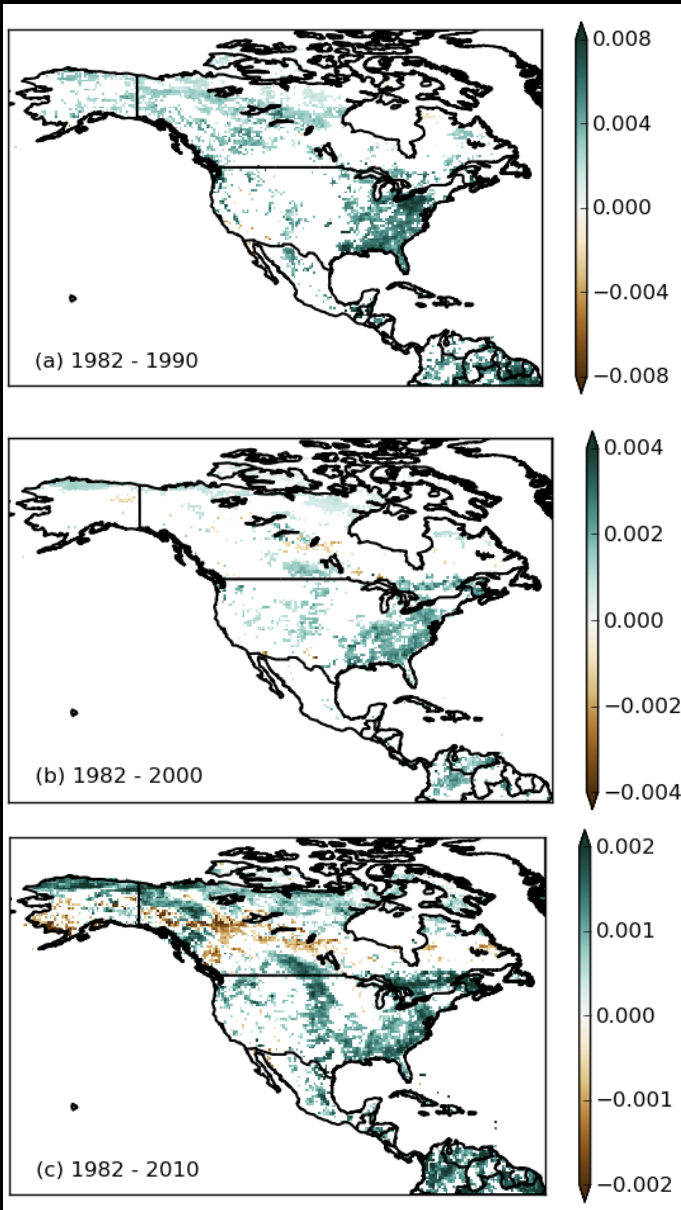
Input: 35 CMIP5 models  
Downscaling method: BCSD  
Temporal Resolution: Monthly  
Spatial Resolution: 800m  
Temporal Resolution: 2006-2100  
PRISM data for bias correction

Output variables:  
Ave Max Temperature  
Ave Min temperature  
Total Precipitation  
Ave Humidity  
Ave Solar Radiation  
  
Individual model outputs  
Ensemble means  
Percentiles  
**Volume: 22TB**

Distribution of the downscaled data

From: GSFC/NCCS  
Format: Earth System Grid (ESG)  
API from Google Earth Engine

# Activity 2: Historical AVHRR data analysis



GIMMS AVHRR NDVI, 1981 – 2011

Special issue of open journal "Remote Sensing"

35 manuscripts in preparation

All codes, intermediate results to be available on NEX

All workflows used in generating the manuscripts  
will be available on NEX

Focus on phenology and productivity



# Activity 2: Historical Landsat data analysis

Landsat Thematic Mapper 1984-2012

Monthly composites of surface reflectances

Biophysical products such as LAI

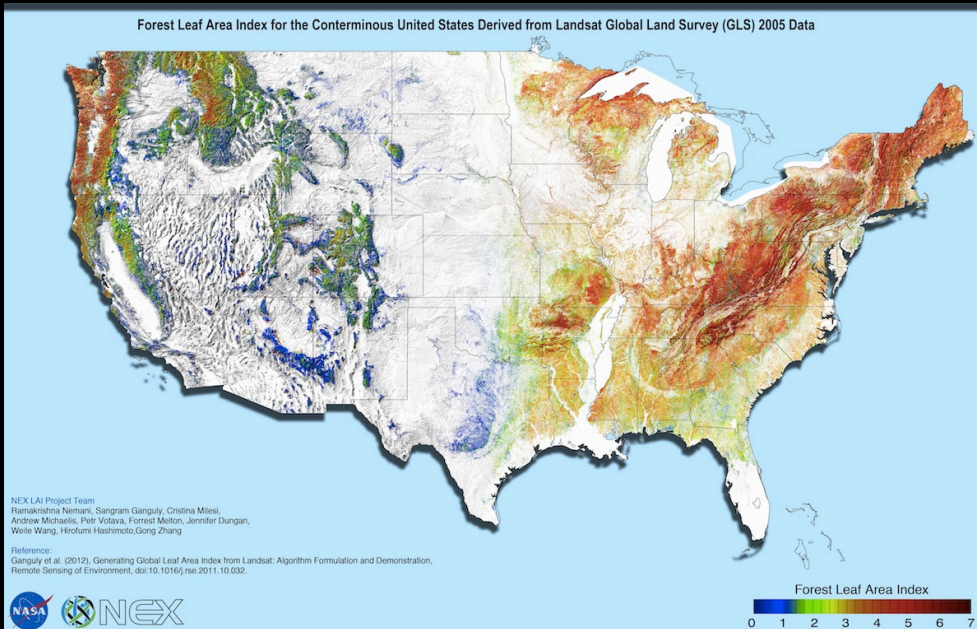
Focus on:

Land cover changes

Migration of ecosystems

High altitude ecosystems

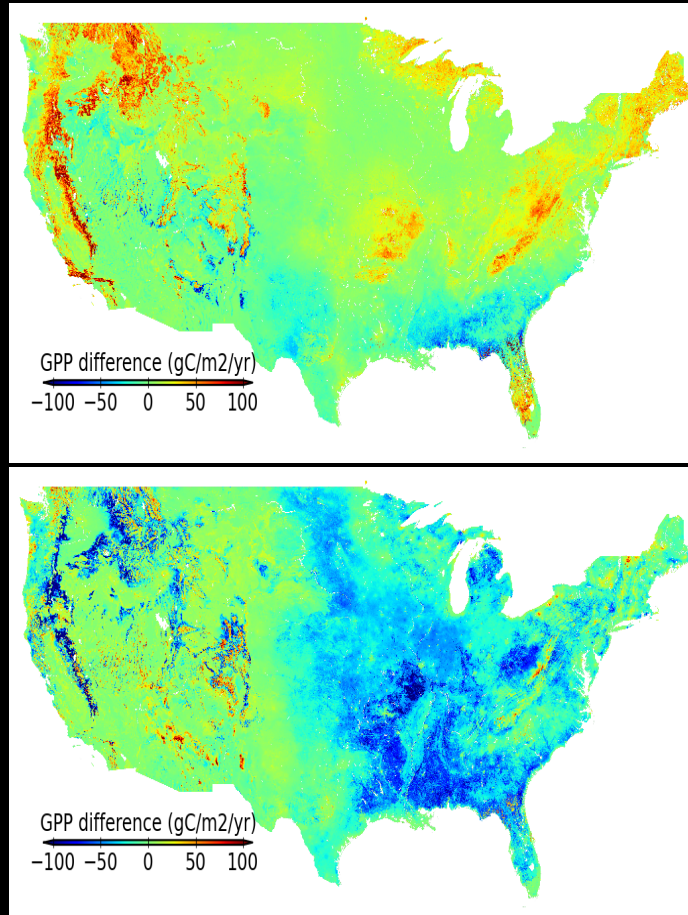
Forest mortality



Map of Leaf Area Index (LAI) generated using Landsat Thematic Mapper data and a modified MODIS LAI/FPAR algorithm

# Activity 3: Climate impact modeling

**BIOME-BGC Simulations of Gross Primary Production (GPP)  
Differences in GPP between 2000's and 2080s**



**Early growing season  
Feb - May**

**Late growing season  
Jul - Oct**

**Extending the MSTMIP (ongoing VEMAP style  
experiment) modeling into the future**

# NEX Resources available to the community

## Data sets:

- 35 CMIP5 model outputs
- 30 yr AVHRR (1981-2011)
- 1972-2012 Landsat (over 1.8 million scenes)
- 800m Downscaled CMIP5 data

## Models:

- BGC
- LPJ
- VIC
- TOPS
- RegCM

## Tools

- CDAT visualization
- VisTrails workflow management

# Community Engagement

## Academic Institutions

1. Walter Jetz, Yale University
2. Andy Hansen, Montana State U
3. Y.Q. Yang, U of RI
4. R. Waring, Oregon State
5. Steve Running, U of Montana
6. Scott Geotz, WHRC
7. Debbie Huntzinger, U of Northern Arizona
8. Ranga Myneni, Boston U
9. Sam Goward, U of Maryland
10. Ed Maurer, Santa Clara U
11. Randy Wynne, Virginia Tech
12. Balaji Rajagopalan, U of Colorado
13. Jonathan Overpeck, U of Arizona
14. Dan Cayan, Scripps Inst. Of Oceanography
15. Larry Band, U of North Carolina
16. David Roy, South Dakota State U.
17. Ralph Keeling, Scripps Inst. Of Oceanography

## Federal Agencies/labs

1. USGS, Jeff Morisette, Prasad T.
2. NOAA, Marty Hoerling, Eric Danner, Mark Eakin
3. USBR, Levi Brekke
4. USFS, Warren Cohen, Jessica Haas
5. EPA, Don Hodge
6. USFWS, Tom Oliff
7. CASI team, Cristina Milesi
8. NPS, John Gross
9. LLNL, Phil Duffy

## Non-Profit

1. Climate Central, Bridget Thrasher
2. Cal Academy of Sciences, Healy Hamilton
3. John Musinsky, Conservation Int.



# PUBLICATIONS

Gopalakrishnan, R. G. Bala. M. Jayaraman, L. Cao, R. Nemani and H. Ravindranath. 2012. Sensitivity of terrestrial water and energy budgets to CO<sub>2</sub>-physiological forcing: an investigation using an offline land model. *Environmental Research Letters*, 6: DOI: 10.1088/1748-9326/6/4/044013.

Bala, G., K. Caldiera, R. Nemani, G. Ban-Weiss and H. Shin. 2012. Albedo enhancement of marine clouds to counteract global warming: impacts on the hydrological cycle. *Climate Dynamics*, 37, 915-931.

Hashimoto, H, W. Wang, C. Milesi, M. A. White, S. Ganguly and et al., 2012. Exploring simple algorithms for estimating Gross Primary Production in Forested Areas from Satellite Data. *Remote Sensing*, 4, 303-326; doi:10.3390/rs4010303.

Ganguly, S., R. Nemani, G. Zhang, H. Hashimoto, C. Milesi and et al. 2012. Generating global Leaf Area Index from Landsat: Algorithm formulation and demonstration. *Remote Sensing of Environment*, doi:10.1016/j.rse.2011.10.032.

Weng, E., Y. Luo, W. Wang, H. Wang, D.J. Hayes, and et al., 2012. Ecosystem carbon storage capacity as affected by disturbance regimes: a general theoretical model. *Journal of Geophysical Research*, 117, doi:10.1029/2012JG002040.

Samanta et al., 2012. Seasonal changes in leaf area of Amazon forests from leaf flushing and abscission, *J. Geophys. Res.* VOL. 117, G01015, doi: 10.1029/2011JG001818

L. Xu, R. B. Myneni, F. S. Chapin III, T. V. Callaghan, J. E. Pinzon, C. J. Tucker, H. Tømmervik, E. S. Euskirchen, S. Piao, P. Ciais, S. Ganguly, R. R. Nemani, J. C. Stroeve, B. C. Forbes. 2012. Diminishing Seasonality in Northern Vegetation Photosynthetic Capacity From Amplified Surface Warming During 1981 to 2010. *Nature Climate Change* (in revision).

Wang, W., P. Ciais, R. Nemani, J.G. Canadell, S. Piao, and et al., 2012. Variations in atmospheric CO<sub>2</sub> growth rates controlled by tropical temperature. *PNAS* (in revision).

Bala, G, N. Devaraju, R. Chaturvedi, K. Caldeira, and R. Nemani. 2012. Nitrogen deposition: How important is it for global terrestrial carbon uptake?, *PNAS* (in review)

Zhang, G., S. Ganguly, R. Nemani, M. White, W. Wang, and et al., 2012. A simple parametric estimation of live forest aboveground biomass in California using satellite derived metrics of canopy height and leaf area index. *Biogeosciences* (in review)

## FY13 PLANS

Workflow management

Visualization

Data dissemination/support

Work with impact modeling teams